# A roadmap to estimating agricultural ammonia volatilization over Europe using satellite observations and simulation data

Rimal Abeed<sup>1</sup>, Camille Viatte<sup>1</sup>, William C. Porter<sup>2</sup>, Nikolaos Evangeliou<sup>3</sup>, Cathy Clerbaux<sup>1,4</sup>, Lieven
 Clarisse<sup>4</sup>, Martin Van Damme<sup>4,5</sup>, Pierre-François Coheur<sup>4</sup>, and Sarah Safieddine<sup>1</sup>

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- 8 <sup>3</sup>Norwegian Institute for Air Research (NILU), Department of Atmospheric and Climate Research (ATMOS), Kjeller, Norway
- 9 <sup>4</sup>Université libre de Bruxelles (ULB), Spectroscopy, Quantum Chemistry and Atmospheric Remote Sensing (SQUARES),
- 10 Brussels, Belgium
- <sup>5</sup>Belgian Institute for Space Aeronomy (BIRA-IASB), Brussels 1180, Belgium
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#### 15 Abstract

16 Ammonia (NH<sub>3</sub>) is one of the most important gases emitted from agricultural practices. It affects air quality and the 17 overall climate, and is in turn influenced by long-term climate trends as well as by short-term fluctuations in local and regional 18 meteorology. Previous studies have established the capability of the Infrared Atmospheric Sounding Interferometer (IASI) 19 series of instruments, aboard the Metop satellites, to measure ammonia from space since 2007. In this study, we explore the 20 interactions between atmospheric ammonia, land and meteorological variability, and long-term climate trends in Europe. We 21 investigate the emission potential ( $\Gamma_{soil}$ ) of ammonia from the soil, which describes the soil – atmosphere ammonia exchange. 22  $\Gamma_{soil}$  is generally calculated in-field or in laboratory experiments; here, and for the first time, we investigate a method which 23 assesses it remotely using satellite data, reanalysis data products, and model simulations.

We focus on ammonia emission potential during March 2011, which marks the start of growing season in Europe. Our results show that  $\Gamma_{soil}$  ranges from  $2 \times 10^3$  to  $9.5 \times 10^4$  (dimensionless) in a fertilized cropland, such as in the North European Plain, and is of the order of  $10 - 10^2$  in a non-fertilized soil (e.g. forest and grassland). These results agree with infield measurements from the literature, suggesting that our method can be used in other seasons and regions in the world. However, some improvements are needed in the determination of mass transfer coefficient k (m s<sup>-1</sup>), which is a crucial parameter to derive  $\Gamma_{soil}$ .

Using a climate model, we estimate the expected increase in ammonia columns by the end of the century based on the increase in skin temperature (T skin), under two different climate scenarios. Ammonia columns are projected to increase by up to 50 %, particularly in Eastern Europe, under the SSP2-4.5 scenario, and might even double (increase of 100 %) under the SSP5-8.5 scenario. The increase in skin temperature is responsible for a formation of new hotspots of ammonia in Belarus, Ukraine, Hungary, Moldova, parts of Romania, and Switzerland.

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<sup>6 &</sup>lt;sup>1</sup>LATMOS/IPSL, Sorbonne Université, UVSQ, CNRS, Paris, France

<sup>7 &</sup>lt;sup>2</sup>Department of Environmental Sciences, University of California, Riverside, CA 92521, USA

<sup>13</sup> Correspondence to: Rimal Abeed <u>rimal.abeed@latmos.ipsl.fr</u>

#### 50 1. Introduction

51 Ammonia (NH<sub>3</sub>) emissions have been increasing in a continuous manner from 1970 to 2017 (McDuffie et al., 2020). During 52 the period 2008 - 2018 alone, the increase in ammonia columns in Western and Southern Europe amounted to  $20.8 \text{ \% yr}^{-1}$  (± 53 4.3 %), and to 12.8 % yr<sup>-1</sup> ( $\pm$  1.3 %) globally (Van Damme et al., 2021). Although ammonia alone is stable against heat and 54 light, it is considered a very reactive base, and it constitutes the largest portion of the reactive nitrogen  $(N_r)$  on Earth. The vast 55 majority of atmospheric ammonia that is not deposited is transformed into fine particulate matter (PM<sub>2.5</sub>) composed of 56 ammonium ( $NH_4^+$ ), through acid – base chemical reactions with available acids in the environment, namely sulfuric acid 57 (H<sub>2</sub>SO<sub>4</sub>), hydrochloric acid (HCl), and nitric acid (HNO<sub>3</sub>) (Yu et al., 2018), while only 10 % of the total ammonia gas is 58 believed to be oxidized by hydroxyl radicals (OH<sup>-</sup>) (Roelle and Aneja, 2005). PM<sub>2.5</sub> has degrading effects on human health, 59 especially respiratory diseases (Bauer et al., 2016). Soils are known to be a source of atmospheric ammonia, especially in areas 60 of intensive agricultural practices (Schlesinger and Hartley, 1992), and this is due to enriching the soil with the reactive nitrogen present in fertilizers. The increase in the application of synthetic fertilizers, and intensification of agricultural practices is 61 62 believed to be the dominant factor of the global increase in ammonia emissions over the past century (Behera et al., 2013; 63 McDuffie et al., 2020). In addition to agriculture, ammonia can be emitted from industrial processes, biomass burning (Van 64 Damme et al., 2018), and natural sources such as from seal colonies (Theobald et al., 2006).

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66 Following the application of fertilizers, ammonium and ammonia are released in the soil. Prior to its volatilization, ammonia 67 in the soil exists either in the gas phase  $(NH_{3 (g)})$  or in the aqueous/liquid phase  $(NH_{3 (aq)})$ , the equilibrium between both states 68 of ammonia is governed by Henry's law (Wentworth et al., 2014), as shown in the Appendix. The dissociation of ammonia in 69 soil water is a function of soil acidity (pH) and temperature (Roelle and Aneja, 2005) (Eq. (A-1) and (A-2) in Appendix A), 70 and controlled by the dissociation constant  $K_{NH^+}$ . Once released to the atmosphere, ammonia near the surface exists is in the 71 gas phase, hence Henry's law can be used to describe the equilibrium between ammonia in the soil (liquid phase), and near the 72 surface (gas phase). This bi-directional exchange between the soil and the atmosphere will continue until the equilibrium is 73 reached, and this occurs when ammonia concentration is equal to the compensation point  $\chi_{NH_3}$  (the concentration of ammonia 74 at equilibrium). The flux of ammonia from the soil to the atmosphere (emission) occurs when the concentration of atmospheric 75 ammonia is less than the compensation point  $\chi_{NH_3}$ , while ammonia deposition occurs when the concentration of ammonia is equal to or greater than  $\chi_{NH_3}$  (Flechard et al., 2011; Wichink Kruit, 2010). It is then crucial to quantify the compensation point 76 77 in order to understand this bi-directional exchange. The main variables needed to calculate  $\chi_{NH_2}$  are soil temperature (T skin) and  $\Gamma_{soil}$ , which is a dimensionless ratio between ammonium and pH (NH<sub>4</sub><sup>+</sup><sub>(aq)</sub> and H<sup>+</sup><sub>(aq)</sub> concentrations, respectively, in the 78 soil). All the equations are described in Appendix A (Eq. (A-1) to (A-15)). 79 80

The soil emission potential ( $\Gamma_{soil}$ ) has been thoroughly investigated in field and controlled laboratory environments (e.g. David et al., 2009; Flechard et al., 2013; Massad et al., 2010; Mattsson et al., 2008; Nemitz et al., 2000; Wentworth et al., 2014, among others).  $\Gamma_{soil}$  is dimensionless and it can range from 20 (non-fertilized soil in a forest) to the order of 10<sup>6</sup> (mixture of slurry in a cropland). It is found to peak right after fertilizers application, due to the increase in ammonium content in the soil (a product of urea hydrolysis), and to return to pre-fertilization levels 10 days after the application (Flechard et al., 2010; Massad et al., 2010). Little information exists on regional or global scales to assess the large-scale spatial variability of ammonia emission potentials.

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89 In order to meet the needs of a growing population, agricultural practices have intensified during the 2003 – 2019 period (more 90 fertilizer use per surface area), resulting in increased net primary production (NPP) per capita (Potapov et al., 2022) and 91 volatilized ammonia (due to increase in both nitrogen soil content, and cultivated lands). In Europe alone, the area of croplands 92 increased by 9 % from 2003 to 2019, and most of the expansion took place on lands that were abandoned for more than 4 years 93 (Potapov et al., 2022). Around 90 % of the mineral fertilizers used in Europe are nitrogen-based, with urea and nitrate fertilizers 94 dominating the market in the 27 EU countries, since they make up 22 % and 45 % of the total market (Fertilizers Europe, 2016). 95 With the increase in croplands area and agricultural activities, climate change will have a significant effect on agricultural 96 practices, with warmer climates enhancing the volatilization of ammonia from soils, especially in intensely fertilized lands 97 (Shen et al., 2020).

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99 This study aims at exploring ammonia emission potential and volatilization in Europe, using infrared satellite data of ammonia 100 columns, reanalysis temperature data, and chemical transport model simulations to provide information on chemical sources 101 and sinks. We specifically study the relationship between satellite-derived ammonia concentration at the start of the growing 102 season, soil emission potentials and their spatial variability over Europe during March of 2011. Section 2 provides the

103 methods/datasets used. The results are described in Sect.3, including simulation from GEOS-Chem in Sect. 3.1. Regional

emission potentials are shown and discussed in Sect. 3.2. Using a climate model, future projections of ammonia columns are investigated under different climate scenarios in Sect. 3.3. Conclusions are listed in Sect. 4.

#### 106 2. Methodology

#### 107 **2.1.** Calculation of the emission potential

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109 In this study, we use IASI satellite data to calculate the ammonia emission potential  $\Gamma_{soil}$  instead of field soil measurements. In 110 field studies,  $\Gamma_{soil}$  is calculated by measuring the concentration of ammonium (NH<sub>4</sub><sup>+</sup>) and H<sup>+</sup> (10<sup>-pH</sup>) in the soil; the ratio between both of these concentrations is  $\Gamma_{soil}$ . Here, we use infrared satellite observations which offer a regional coverage over 111 112 Europe. With these, however, we cannot monitor soil content of ammonium nor its pH. This renders the remote  $\Gamma_{soil}$  calculation challenging, and less straight forward. The full derivation of the equation used to calculate the emission potential is explained 113 114 in Appendix A. In short, upon its dissolution in the soil water, ammonia follows Henry's law. In steady-state conditions between 115 the soil and the near surface, the amount of the ammonia emitted and lost is considered equal. Based on this assumption, the 116 soil emission potential (dimensionless) is calculated as shown in Eq. (2-1) or Eq. (A-15) in Appendix A:

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$$\Gamma_{soil} = \frac{[NH_3]^{col} \cdot T_{soil}}{\exp(\frac{-b}{T_{soil}})} \frac{M_{NH_3}}{a \cdot N_a \cdot c'} \cdot \frac{1}{k\tau}$$
(2-1)

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where  $[NH_3]^{col}$  is the total column concentration of ammonia (molecules cm<sup>-2</sup>), measured by satellite remote sensors,  $T_{soil}$  is the soil temperature at the surface, which can be expressed as the skin temperature T skin (Kelvin), *a* and *b* are constants (*a* =  $2.75 \times 10^3 \ g \ K \ cm^{-3}$ ,  $b = 1.04 \times 10^4 \ K$ ),  $M_{NH_3}$  is the molar mass of ammonia ( $M = 17.031 \ g \ mol^{-1}$ ), and  $N_a$  is Avogadro's number ( $N_a = 6.0221409 \times 10^{23} \ molecules \ mol^{-1}$ ), *c'* is 100 and is added to convert *k* from m s<sup>-1</sup> to cm s<sup>-1</sup> (since  $[NH_3]^{col}$  is in molecules cm<sup>-2</sup>), and  $\tau$  the lifetime of ammonia (seconds).

k is the soil – atmosphere exchange coefficient or deposition velocity (cm s<sup>-1</sup>), also known as the mass transfer coefficient (this nomenclature will be used in this study). It is a function of the roughness length of the surface, wind speed, the boundary layer height (Olesen and Sommer, 1993; Van Der Molen et al., 1990), and pH (Lee et al., 2020). It can also be calculated using a resistance model, often used to explain the exchange between the surface and the atmosphere (Wentworth et al., 2014). Different studies provide look up tables values of *k* for different land cover types and different seasons based on this resistance model (Aneja et al., 1986; Erisman et al., 1994; Phillips et al., 2004; Roelle and Aneja, 2005; Svensson and Ferm, 1993; Wesely, 1989).

In general, the mass transfer coefficient k is in the order of  $10^{-3}$  to  $10^{-2}$  m s<sup>-1</sup> in a mixture of soil and manure, and  $10^{-6}$  to  $10^{-5}$  m s<sup>-1</sup> in a mixture of manure alone (Roelle and Aneja, 2005). We discuss and provide more information on k in Sect. 3.2, and additional details on this calculation in general are provided in Appendix A.

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#### 2.2. IASI ammonia, ERA5 T skin, and MODIS Land cover

137 The Infrared Atmospheric Sounding Interferometer (IASI) is considered the most innovative instrument onboard the polar-orbiting Metop satellites (Klaes, 2018). Three IASI instruments are onboard Metop-A, B and C, the series of satellites 138 139 launched by the EUMETSAT (European Organization for the Exploitation of Meteorological Satellites) in 2006, 2012, and 140 2018, respectively. The Metop-A satellite was de-orbited in October 2021 (Lentze, 2021), and as a result only two instruments 141 (IASI-B and C onboard Metop-B and C) are operating today. The observations from IASI cover any location on Earth at 9:30 in the morning (AM) and in the evening (PM), local solar time. It can detect a variety of atmospheric species including trace 142 143 gases (Clerbaux et al., 2009). The IASI Fourier-transform spectrometer monitors the atmosphere in the spectral range between 144 645 and 2760 cm<sup>-1</sup> (thermal infrared), and is nadir-looking. IASI has a swath width that measures 2200 km, with a pixel size 145 of ~12 km.

Ammonia was first detected with IASI using the  $v_2$  vibrational band (~950 cm<sup>-1</sup>) (Clerbaux et al., 2009; Coheur et al., 2009). The ammonia total columns used in this study are the product of an Artificial Neural Network and re-analyzed temperature data from the European Centre for Medium-Range Weather Forecasts (ECMWF) product ERA5 ANNI-NH<sub>3</sub>-v3R-ERA5 (Van Damme et al., 2021). Several studies used ammonia data from IASI to study hotspots of ammonia of different source types including both natural and anthropogenic sources (Clarisse, Van Damme, Clerbaux, et al., 2019; Clarisse, Van Damme, Gardner, et al., 2019; Dammers et al., 2019; Van Damme et al., 2018, 2021; Viatte et al., 2021). Recently, IASI observations
were used to study the effect of war and conflict on agricultural practices in Syria (Abeed et al., 2021).

Fewer errors on the retrieval were observed during the day and over land (Van Damme et al., 2017), hence, we use only daytime ammonia measurements from IASI. Comparisons with ammonia measured using a ground-based instrument showed a good correlation of R=0.75 (Viatte et al., 2021). Satellite ammonia data from CrIS (Crosstrack Infrared Sounder) (Shephard and Cady-Pereira, 2015) were compared with those from IASI, and were equally found to give similar results when looking at concentrations from a wildfire (Adams et al., 2019), showing consistency when studying seasonal and inter-annual variability (Viatte et al., 2020).

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162 In addition to ammonia, we look at skin temperature (T skin or land surface temperature LST) data from the ECMWF reanalysis (ERA5) at a grid resolution of  $0.25 \times 0.25^{\circ}$  (Hersbach et al., 2020). ERA5 Temperatures are interpolated temporally and 163 spatially to the IASI morning overpass (~9:30 A.M. local time), since we only consider daytime ammonia. ERA5 temperature 164 165 data are also used in the retrieval process of the ammonia data we used in this study NH<sub>3</sub>-v3R-ERA5 (Van Damme et al., 2021). 166 T skin is defined as the temperature of the uppermost surface layer when radiative equilibrium is reached. It also represents the 167 theoretical temperature required in order to reach the surface energy balance (ECMWF, 2016). Skin temperature in Europe 168 varies with a standard deviation on the daily average that is mostly between 2 and 6°C, in Northern, Central, Western and 169 South-western Europe. And between 4 to 8°C in Eastern Europe (not shown here).

171 In order to assign a mass transfer coefficient k to each land type, we used data from the moderate resolution imaging 172 spectroradiometer (MODIS), a series of instruments orbiting the Earth aboard the Aqua and Terra satellites. The data product 173 MCD12Q1 (version 6) is a combined Aqua/Terra Land cover type product, with a spatial resolution of 500 m. This product 174 provides maps of land cover type from 2001 through 2019 (Sulla-Menashe and Friedl, 2018). From the land-use categories 175 included in the MOD12Q1 product (Belward et al., 1999) we focus on croplands, forests, shrublands, and grasslands. We do 176 not include barelands, snow cover, and urban areas in our analysis; we are not interested in studying these surfaces, since we 177 focus on ammonia volatilization from the soil in areas where fertilizers are applied. In addition to croplands, in this study we show the emission potential in forests and grasslands/shrublands for comparison with values in the literature. In an attempt to 178 179 calculate an emission potential (Eq. (2-1)) that is relevant to the land cover/use, we therefore assign a mass transfer coefficient 180 k to each land type based on literature values (Aneja et al., 1986; Erisman et al., 1994; Roelle and Aneja, 2005; Svensson and 181 Ferm, 1993; Wesely, 1989) and we discuss it in Sect. 3.2.

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# 183 **2.3. Model simulations**

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# 2.3.1. GEOS-Chem Chemistry Transport Model

186 In this study we use version 12.7.2 of the GEOS-Chem chemical transport model (Bey et al., 2001). The model is driven by 187 the Modern-Era Retrospective Analysis for Research and Applications version 2 (MERRA-2) reanalysis product, including nested domains over Europe at a  $0.5^{\circ} \times 0.625^{\circ}$  horizontal resolution. MERRA-2 is the second version of the MERRA 188 atmospheric reanalysis product by NASA Global Modulation Assimilation Office (NASA/GMAO) (Gelaro et al., 2017). 189 Boundary conditions for the nested domains are created using a global simulation for the same months at  $2^{\circ} \times 2.5^{\circ}$  resolution. 190 191 We generate model output for March of 2011, preceded by a one month of discarded model spin-up time for the nested run, 192 and two months for the global simulation. March corresponds well to the beginning of the growing season (FAO, 2022; USDA, 193 2022), and as such to the month of fertilizers application in Europe. 194

Output includes the hourly mean for selected diagnostics. Anthropogenic emissions are taken primarily from the global
 Community Emissions Data System (CEDS) inventory (Hoesly et al., 2018). Biogenic non-agricultural ammonia, as well as
 ocean ammonia sources, are taken from the Global Emission Inventories Activities database (GEIA, (Bouwman et al., 1997)).
 Open fire emissions are generated using the GFED 4.1s inventory (Randerson et al., 2015). We used the Harmonized Emissions
 Component module (HEMCO) to obtain the ammonia emissions over Europe (Keller et al., 2014).

# 201 2.3.2. EC-Earth Climate model

202 To analyze how future climate will affect ammonia concentration and emission potential, we use the ECMWF European Earth 203 Consortium climate model (EC-Earth, http://www.ec-earth.org/). While other climate models exist, we choose this one because the ammonia product from IASI uses ERA5 for the retrievals and we calculate the emission potential from the T skin product 204 205 of ERA5. The reanalysis uses the ECMWF Integrated Forecasting System for the atmosphere-land component (IFS). IFS is 206 also used in EC-Earth and is complemented with other model components to simulate the full range of Earth system interactions 207 that are relevant to climate (Döscher et al., 2021). We note that the versions of the IFS models used in ERA5 and in EC-Earth 208 are not identical as the climate model product is not assimilated and is not initialized with observations several times a day like 209 ERA5. The EC-Earth simulations are included in the Climate model intercomparison project, phase 6 (Eyring et al., 2016), part 210 of the Intergovernmental Panel on Climate Change (IPCC) report of 2021 (Masson-Delmotte, et al., 2021). We use the socalled Scenario Model Intercomparison Project (Scenario MIP), covering the period [2015 - 2100] for future projections under 211 different shared socio-economic pathways (SSP) (Riahi et al., 2017). We analyze two scenarios: the SSP2-4.5, a "middle of the 212 213 road" socio-economic scenario with a nominal 4.5 W/m<sup>2</sup> radiative forcing level by 2100, similar to the RCP-4.5 scenario, and the SSP5-8.5, the upper edge of the SSP scenario spectrum with a high fossil-fuel development use over the 21st century. 214

#### 215 2.4. GEOS-Chem validation with IASI

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To analyse how well the model simulates atmospheric ammonia, we compare the simulated GEOS-Chem hourly averaged (March 2011) ammonia total columns output (Sect. 2.3.1) with the IASI-NH<sub>3</sub> total columns gridded on the same horizontal resolution  $(0.5^{\circ} \times 0.625^{\circ})$  and during the same month. We applied temporal coincidence criterion to GEOS-Chem outputs in order to compare them with IASI morning observations. For instance, we selected data between 8:30 and 11:30 UTC in the GEOS-Chem model output.

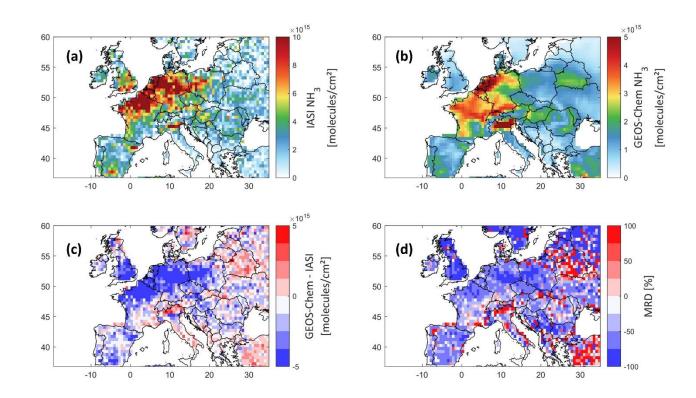


Figure 1. Ammonia total column concentrations from IASI (panel a), and GEOS-Chem (panel b), the difference between both datasets (panel c) in molecules cm<sup>-2</sup>, and the Mean Relative Difference (MRD) in % (panel d); all data are a monthly average of March 2011at a  $0.5^{\circ} \times 0.625^{\circ}$  grid resolution. Note that the colour bar limits are different between panels (a) and (b).

- Figure 1 shows the IASI NH<sub>3</sub> distribution (Figure 1a), and that from GEOS-Chem (Figure 1b), the bias between the two (Figure
- 1c), and the mean relative difference MRD (Figure 1d), all during March 2011. MRD is calculated as the mean of the ratio

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228 Generally, both GEOS-Chem and IASI show coincident sources of ammonia, reflecting the good ability of the model to 229 reproduce ammonia columns over major agricultural source regions in Europe. The bias between IASI and GEOS-Chem and 230 the mean relative difference (MRD) are shown in Figure 1c and d. Ammonia columns from GEOS-Chem are underestimated by up to  $2 \times 10^{16}$  molecules cm<sup>2</sup> in some source regions/hotspots, especially in England, North Eastern France, the North 231 232 European Plain (Netherlands, Belgium), and Spain (around Barcelona). Similar results were found in the study of Whitburn et al. (2016), in which they show that GEOS-Chem underestimates ammonia columns by up to  $1 \times 10^{16}$  molecules cm<sup>-2</sup> in Europe 233 234 on a yearly average in 2009, notably in the North European Plain. It is important to note that, in our study, we compare only 235 one month of data (March, 2011) which marks the start of the growing season in the majority of the countries of interest (FAO, 236 2022; USDA, 2022). The differences are most likely due to the fact that, with IASI, cloud-free data are used to retrieve 237 ammonia. In most of the studied regions, the MRD is around 50 % ( $\pm$ 7 %) in absolute value, for instance, in Brittany MRD = 238 -43 %, whereas in both Barcelona and Valladolid in Spain, it is -57 %. While England shows the highest MRD value in absolute terms (-79 %), the best represented region is the Po Valley (+0.1 %), then follows the region of New Aquitaine in 239 240 the southwest of France (-34.1 %) (see Table 1). A summary of the results of this study, including the MRD over some source 241 regions is listed in Table 1. Although the biases and MRD values can be considered as high, the spatial distribution is consistent 242 between IASI and GEOS-Chem. Therefore, we assume that meteorological and soil parameters affecting one dataset (e.g. IASI 243  $NH_3$ ) are applicable to the other (e.g. model simulation), this is known as the steady-state approximation. It is worth noting that 244 although we do not use the latest version of GEOS-Chem, the results we obtain reflect our current understanding of the regional 245 chemistry at this horizontal and temporal resolution.

The frequency of fertilizers application can vary per crop type and per country, as well as from year to year. In Europe, however,
the N applied per surface area is quite stabilized after year 1980, with some interannual fluctuations in most European countries
(Einarsson et al., 2021). As to our knowledge, accurate information on the application frequency per country is not reported.
While the application frequency can change from year to year, the fluctuations are less pronounced after the year 2000. For
instance, in France and Belgium the nitrogen content fluctuates between 100 and 110 kg N/ha/year, from 2000 to 2020
(Einarsson et al., 2021).

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# 254 **3. Results and discussions**

#### **3.1.** Ammonia emissions, losses and lifetime in Europe

In order to understand the  $NH_3$  spatial variability in Europe during the application of fertilizers, a detailed analysis of the output of the GEOS-Chem simulation for the month of March 2011 is shown in Figure 2.

The anthropogenic sources (i.e. mainly agriculture) constitute 83 % of the total ammonia emissions during March 2011 in Europe. The ammonia emissions from natural sources (i.e. soil of natural vegetation, oceans, and wild animals) follow representing 16 % of the total emissions, whereas the remaining 1 % correspond to the ammonia emissions from biomass burning and ships (not shown here).

Figure 2a shows the monthly emissions of ammonia. Most of these emissions are due to agricultural activities (not shown here); we identify 8 source regions which we investigate thoroughly in this study shown as rectangles A to H. The agricultural sources with the highest contribution are located in the North European Plain, Brittany, and the Po Valley (regions C, D, and F).

In the calculation of the total loss of ammonia (Figure 2b), we considered dry deposition, chemistry, transport, and wet deposition (in which we included ammonia loss to convection) from the GEOS-Chem model simulation, which are all possible loss processes for ammonia (David et al., 2009). Figure 2b shows that the largest losses occur logically where we have the highest sources detected (see Figure 2a).

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 $<sup>\</sup>frac{(GeosChem NH_3 - IASI NH_3) \times 100}{IASI NH_2}$  at each grid point.

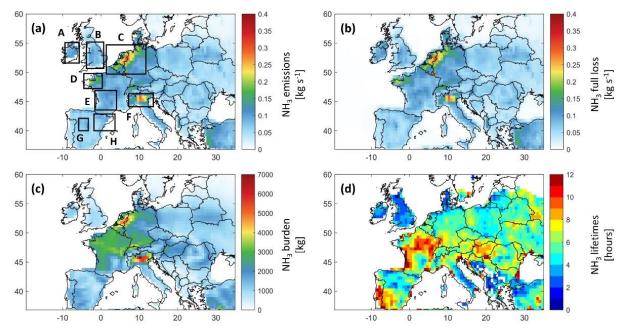


Figure 2. Ammonia budget in Europe from GEOS-Chem: (a) Ammonia emissions from the Harmonized Emissions Component module (HEMCO) in kg s<sup>-1</sup> with our regions of interest shown in rectangles, (b) ammonia full loss in kg s<sup>-1</sup>, (c) ammonia total burden in kg, and (d) ammonia lifetime in hours. All plots refer to March 2011 and are presented at a  $0.5^{\circ} \times 0.625^{\circ}$  grid resolution.

The total ammonia burden (Figure 2c) is calculated as the integrated sum of all ammonia columns in the model grid box. We can clearly detect ammonia hotspots over Europe, in particular the North European Plain, Brittany and the Po Valley, all these regions are characterized by intense agricultural activities, as the total emissions and deposition show (Figure 1 and Figure 2). We also see that the burden is generally the highest over France, Belgium, The Netherlands, and parts of Germany and Italy.

The lifetime  $\tau_{ss}$  of ammonia is shown in Figure 2d. In the case of a gas with a short lifetime, such as ammonia, the emissions are relatively well-balanced spatially by eventual sinks/losses (steady-state approximation). Therefore, we can calculate a steady-state lifetime as the ratio between the total burden *B* (Figure 2c) and the total emissions *E* or losses *L* (sum of all emitted/lost molecules, Figure 2a or b) using the following equation:  $\tau_{ss} = \frac{B}{L}$  (Plumb and Stolarski, 2013).

We note that the  $\tau_{ss}$  is more or less the same whether we calculate it using the losses or the emissions. For instance, in selected 281 282 source regions (rectangles in Figure 2a) the total emissions and losses are very close with very low biases that are less than 2% 283 (not shown here). Our results show that  $\tau_{ss}$ , on a monthly average, can go up to 12 hours, and it can reach 1 day (24 hours) in 284 coastal regions such as region E in New Aquitaine in France. The latter can be related to the high probability of air stagnation 285 in that area, especially during spring, in comparison to Northern Europe (Garrido-Perez et al., 2018), since higher PM<sub>2.5</sub> 286 pollution episodes were found under stagnant meteorological conditions (AQEG, 2012), and these PM<sub>2.5</sub> particles can 287 dissociate, releasing ammonia. Our results agree with the literature suggesting a residence time between a few hours to a few 288 days (Behera et al., 2013; Pinder et al., 2008). We note that Evangeliou et al. (2021) estimated the lifetime of ammonia over 289 Europe using a different model and the results showed a monthly average ranging from 10 to 13 hours. The figure adapted from 290 Evangeliou et al. (2021) is shown in supplementary material (Figure S1). Shorter lifetimes from industrial sources of ammonia 291 were reported in Dammers et al. (2019), with a mean lifetime of ammonia that is equal to 2.35 hours ( $\pm 1.16$ ). A recent study 292 found lifetimes of ammonia that vary between 5 and 25 hours, roughly, in Europe (Luo et al., 2022); these values are higher 293 since, in addition to ammonia loss, Luo et al. (2022) included the loss of ammonium, and thus considered the loss of ammonia 294 only terminal when the ammonium is also lost/deposited. This approach is not adopted here nor in Evangeliou et al. (2021). 295

Notably, ammonia lifetime and burden (Figure 2c, and d) each have different spatial distribution compared to the other 2 panels (Figure 2a, and b). The ammonia residence time in the atmosphere varies depending on the sources and more importantly on the locally dominant loss mechanisms. For this reason, in Figure 3, we show the relative contribution of the ammonia loss mechanisms, presented as pie charts, for the agricultural source regions shown in black boxes in Figure 2a.

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301 The fastest loss mechanisms are either chemical (i.e. in the vast majority transformation to particulate matter) or through wet 302 and dry deposition (Tournadre et al., 2020). Figure 3 shows that more than 50 % of the ammonia molecules in the atmosphere 303 are lost to chemical reactions in most of the regions (A, B, C, H, and F). The shortest residence time of ammonia is observed 304 in England, where the chemical removal was significantly higher than other sinks and represented up to 73 % of the total 305 ammonia loss pathways, suggesting a rapid transformation into inorganic particulate matter ( $PM_{25}$ ). In the regions D, G and E 306 the chemical loss makes up 50 %, 49 %, and 42 %, respectively. In fact, in March 2011, PM was found to be mostly composed 307 of inorganic nitrate (41%), and ammonium (20%) (Viatte et al., 2022) over Europe, both of which are products of atmospheric 308 ammonia, For instance, nitrate-bearing PM<sub>2.5</sub> are formed when nitric acid (HNO<sub>3</sub>) reacts with ammonia (Yang et al., 2022). 309 while ammonium is a direct product of the hydrolysis of ammonia. 41% of the nitric acid formed in the atmosphere is produced 310 from the reaction between nitrogen dioxide (NO<sub>2</sub>) and the hydroxyl radical (OH) (Alexander et al., 2020). These chemical pathways help explain the large chemical losses in most of the regions studied in Figure 3. 311 312

313 Ammonia loss to transport is the highest in regions neighbouring the Atlantic Ocean, accounting for 30 %, 27 %, 32 %, and 34 % of total sinks in regions A. D. E. and G respectively. These regions are exposed to the North Atlantic Drift, also known as 314 315 the Gulf Stream, that is associated with high wind speed and cyclonic activity (Barnes et al., 2022). Although the gulf stream 316 also affects the loss to transport in England (region B), the chemical loss is the dominant one. Acids, such as HNO<sub>3</sub> and  $H_2SO_4$ 317 react with ammonia in the atmosphere. Therefore, high atmospheric concentrations of NO<sub>2</sub> and SO<sub>2</sub> (from which HNO<sub>3</sub> and 318 H<sub>2</sub>SO<sub>4</sub> are derived respectively), induce higher loss of ammonia to chemical reactions. In England, the annual concentration 319 mean of both NO<sub>2</sub> and SO<sub>2</sub> are higher than in Ireland (European Environment Agency, 2017a, 2017b). This can explain why 320 the largest proportion of NH<sub>3</sub> is lost to chemistry in England, in spite of the effect of the gulf stream. In other regions, 14 % to 22 % of the total ammonia is lost to transport mechanisms, and in all regions, 11 to 22 % is lost to dry deposition (Figure 3). 321

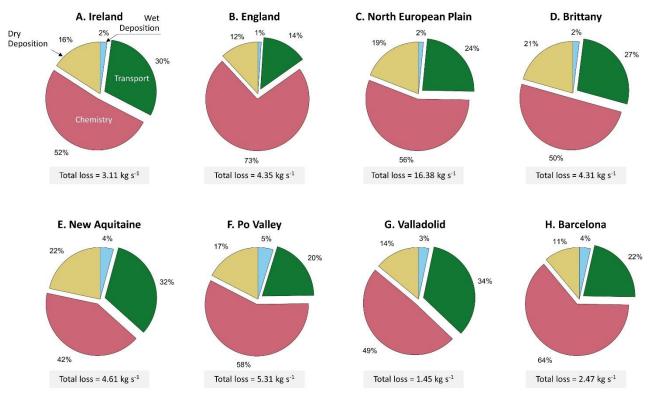


Figure 3. Repartition of the ammonia loss mechanisms for major agricultural areas in Europe, during March 2011, as retrieved from GEOS-Chem, with the total ammonia loss shown in a grey box under each pie chart (kg s<sup>-1</sup>). The regions are shown in black boxes in Figure 2a.

During March, precipitation is relatively lower as compared to winter (December, January, February) in Europe. Furthermore,
 2011 was a particular dry year compared to the 1981 – 2010 average (Met Office, 2016). Drought was reported to be severe in
 areas such as France, Belgium and the Netherlands, and moderate in England and Ireland (EDO, 2011). This can help explain

the low percentage of wet deposition during March 2011 (1 to 5 % out of the total loss of ammonia).

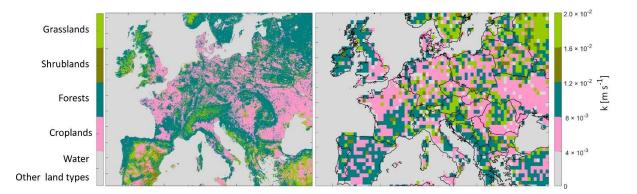
## 327 **3.2.** Ammonia emission potential over Europe

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To calculate emission potential, a calculation of the mass transfer coefficient k, which relates to the land type, is necessary. Figure 4 shows the land cover type from MODIS in Europe (left panel), and the corresponding assigned mass transfer coefficient k (right panel) needed to calculate the emission potential (Eq. (2-1)). In order to choose a mass transfer coefficient that is convenient for the different land types relevant to this study, we searched for k values in the literature. Note that ammonia transfer coefficients are not available for all land types.

For water bodies and other land types that are not considered here (see Sect. 2.2), the mass transfer values k were set to zero 334 335 and represented in grey in Figure 4. In a laboratory experiment, Svensson et al. (1993) reported  $k = 4.3 \times 10^{-3}$  m s<sup>-1</sup> for a 336 mixture of soil and swine manure, therefore, this value was assigned to croplands. Due to the lack of  $NH_3 k$  values for nonfertilized forests, shrublands and grasslands in the literature, we used values originally assigned for SO<sub>2</sub>, bearing in mind that 337 these are approximate values and they reflect mostly the conditions of the soil cover type (short, medium or tall grass) rather 338 than the gas itself. In Aneja et al. (1986), the authors estimated the mass transfer coefficient for both  $NH_3$  and  $SO_2$  above 339 different types of crops, they found similar values. For NH<sub>3</sub>, k varied between 0.3 and 1.3 cm s<sup>-1</sup>, and for SO<sub>2</sub> it varied between 340 341 0.5 and 1.5 cm s<sup>-1</sup> (Aneja et al., 1986). Since the latter study estimates several values for NH<sub>3</sub> mass transfer coefficient, over 342 different types of crops, we will use the k provided by Svensson et al. (1993), since it is better adapted to reflect  $NH_3$  emission 343 from fertilizers, and is not dependent on the crop type. To assign a k value for forests, we used values reported in Aneja (1986)  $(k = 2 \times 10^{-2} \text{ m s}^{-1})$ , which originally represent deposition velocity (mass transfer) of SO<sub>2</sub> in a forest (high crops), since both 344  $SO_2$  and NH<sub>3</sub> showed similar k values above crops. For shrublands and grasslands (the two land types have the same k), we 345 used the value  $k = 8 \times 10^{-3}$  m s<sup>-1</sup> that has been reported in Aneja et al. (1986) as the deposition velocity (mass transfer) of 346  $SO_2$  in a grassland (medium crops). These values obtained by using MODIS land cover types and published estimates of k 347 348 values represent our best effort to realistic mass transfer coefficients, and therefore realistic soil emission potentials.

After choosing the *k* values, we assigned them for each land type on the (500 m  $\times$  500 m) grid. We then aggregate the array with the *k* values from 500 m  $\times$  500 m to the resolution of GEOS-Chem (0.5°  $\times$  0.625° grid box). This leads to averaging different fine pixels with different land cover types into a coarser grid. The result is shown on the right panel of Figure 4.



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Figure 4. MODIS Land Cover Type, at a 500 m × 500 m grid box (left panel), and aggregated mass transfer coefficient k (variable k) on a horizontal resolution of  $0.5^{\circ} \times 0.625^{\circ}$  grid box (right panel).

355 Uncertainties of this methodological approach can be summarized as follows:

- (1) The k value assigned for croplands is approximate and therefore not the same in every cropland over Europe.
- (2) The k value assigned for forests represents the  $SO_2$  exchange in high croplands; this value may be different for ammonia, since NH<sub>3</sub> can easily dissolve in the water film on leaves under conditions of high humidity.
- (3) While changing the resolution of a fine array (500 m  $\times$  500 m), several grid points are merged and averaged together in order to construct the coarser grid box (0.5°  $\times$  0.625°); the result is therefore an average that might mix croplands with neighboring forests/barelands/grasslands. This leads to a range of different k values that are shown on Figure 4.
- 361 362

Using a land-type specific k value is necessary in order to reflect realistic emissions potential, we call this the variable k, as ammonia exchange in a forest is different from that of croplands or unfertilized grasslands, due to different barriers (long, medium or short crop/grass) and ammonium soil content in each land type.

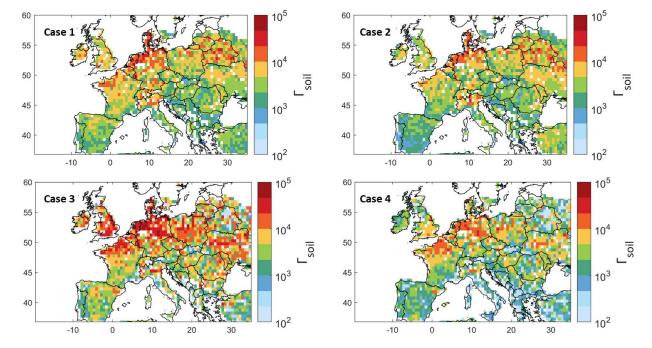


Figure 5. Ammonia soil emission potential ( $\Gamma_{soil}$ ) on a log10 scale from model simulation, observation and reanalysis for 4 different cases (see text for details).

Figure 5 illustrates the ammonia soil emission potential  $\Gamma_{soil}$  calculated using Eq. (2-1) and k values presented in Figure 4. After assigning a variable mass transfer coefficient, the remaining variables needed to calculate  $\Gamma_{soil}$  in Eq. (2-1) are ammonia concentration and lifetime, as well as the skin temperature. Therefore, the emission potential  $\Gamma_{soil}$  shown in Figure 5 is calculated using different configurations:

- Case 1: GEOS-Chem ammonia and lifetime, and MERRA-2 T skin, i.e. simulated  $\Gamma_{soil}$ ,
- Case 2: GEOS-Chem ammonia and lifetime, and ERA5 Tskin, to check the effect of using ERA5 vs MERRA-2 for skin temperature,
- Case 3: IASI ammonia, ERA5 T skin, and GEOS-Chem ammonia lifetime,

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Case 4: IASI ammonia, ERA5 T skin, and ammonia lifetime from Evangeliou et al. (2021), that were calculated using
 LMDz-OR-INCA chemistry transport model. The latter couples three models: The general circulation model GCM
 (LMDz) (Hourdin et al., 2006), the INteraction with Chemistry and Aerosols (INCA) (Folberth et al., 2006), and the
 land surface dynamical vegetation model (ORCHIDEE) (Krinner et al., 2005).

We show in supplementary material Figure S2, the emission potential (similarly to what we show in Figure 5) but from a fixed and averaged k value for all land types. Figure S2 shows the importance of using a variable k that is adjusted to each land type. To calculate a fixed k (common to all land types) we assume 14 days of fertilization ( $k = 10^{-3}$  m s<sup>-1</sup>, e.g. croplands), 7 days when k value is reducing ( $k = 10^{-5}$  m s<sup>-1</sup>), and 10 days when k is low ( $k = 10^{-6}$  m s<sup>-1</sup>, e.g. forests) resulting in an average of  $k = 4.5 \times 10^{-4}$  m s<sup>-1</sup>. The difference in the emission potential between fixed and spatially variable k is shown in supplementary material Figure S3, where we see that a fixed k might overestimate  $\Gamma_{soil}$  by 10 to 10<sup>3</sup> on a log10 scale (500 – 3000 %), in agricultural areas.

When calculating  $\Gamma_{soil}$ , we filtered data points with ammonia total column concentration less than  $5 \times 10^{14}$  molecules cm<sup>-2</sup>. The latter are mostly grid boxes concentrated above 56° North that we consider as noise (shown in white pixels on Figure 5).

391 T skin from ERA5 and MERRA-2 agree very well, with a coefficient of determination  $r^2 = 0.97$  (Figure S4 in the supplementary 392 material). This explains the excellent spatial correlation between cases 1 and 2. Note that when using MERRA-2 T skin, we 393 selected only morning measurements from 8:00 to 10:00 UTC. Since IASI-NH<sub>3</sub> retrievals use ERA5 T skin, this also suggests 394 that using MERRA-2 or ERA5 does not affect our  $\Gamma_{soil}$  calculation. In case 3, the emission potential agrees spatially with that 395 of GEOS-Chem. However, we observe higher *I*soil in regions such as Ireland, England, Northern France, Northeastern Spain, 396 and Poland. This is due to the underestimation of ammonia from GEOS-Chem as compared to IASI observations (Figure 1a). 397 For instance,  $\Gamma_{soil}$  from IASI and ERA5 (case 3) differ with that from GEOS-chem and ERA5 (case 1) by 31 % in Ireland. 398 Looking at Table 1, this difference can be explained by the corresponding MRD for Ireland (-45 %). The differences between 399 case 3 and 4 reach up to +72 % in Ireland, and this is mostly due to the 10-hours difference between ammonia lifetime from 400 GEOS-Chem and Evangeliou et al. (2021) (Figure S1 in the supplementary material). The lowest  $\Gamma_{soil}$  (in most regions) were 401 obtained in case 4, due to the higher lifetime values from Evangeliou et al. (2021), as compared to those calculated from GEOS-402 Chem (Figure S1); note that  $\Gamma_{soil}$  is inversely proportional to ammonia lifetime (Eq. (2-1)). In fact, the longer ammonia stays 403 in the atmosphere (longer lifetime), the less the flux will be directed from the soil to the atmosphere (less ammonia emission). 404 We compared  $\Gamma_{soil}$  calculated from all cases for each region, and we conclude that cases 2 and 4 showed the best compatibility. 405 For instance,  $\Gamma_{soil}$  from cases 2 and 4 differ by only 6% in the North European Plain and Brittany, and by 4% in New Aquitaine. 406 The highest difference between cases 2 and 4 is observed in the Po Valley (53 %) (not shown here).

407 In the four cases presented in Figure 5, we see similar spatial distribution of ammonia emission potential with values ranging 408 from  $12 \times 10^{-1}$  in a forest to  $9.5 \times 10^4$  in a cropland (monthly average considering all the cases). In agricultural lands, our results show that  $\Gamma_{soil}$  ranges from  $2 \times 10^3$  to  $9.5 \times 10^4$ . In fact, most of the studies summarized in Zhang et al. (2010) reported  $\Gamma_{soil}$ 409 that range mostly from  $10^3$  to  $10^4$  in fertilized croplands/grasslands; the minimum  $\Gamma_{soil}$  reported is in the order of  $10^2$  and the 410 maximum is of the order of  $10^5$ . Therefore, our values fit within the range of  $\Gamma_{soil}$  calculated in the literature and summarized 411 412 in Zhang et al. (2010) and the references within. Personne et al. (2015) focused on Grignon, an agricultural region near Paris, 413 France (48°51'N, 1°58'E). They obtained  $\Gamma_{soil}$  values between  $1.1 \times 10^4$  to  $5.8 \times 10^6$ . In the present study, the emission potential 414 over this region is between  $4 \times 10^3$  (case 2) to  $5 \times 10^3$  (case 4). In this study, lower values than those measured in the field are 415 expected. Therefore, we consider our results to be in good agreement with the values in Personne et al. (2015), since ours reflect 416 a 31-day mean of an average of over a large area  $(55 \times 70 \text{ km}^2)$  as compared to the localized measurements done by Personne 417 et al. (2015). 418

419 The mean emission potentials per ammonia source region in Europe (shown in rectangles in Figure 2 and Figure 3) and per 420 case are shown in Figure 6, and listed in Table 1. Table 1 shows the average lifetime from GEOS-Chem (hours), the average 421 T skin from the two datasets that we used (°C), the average ammonia emission potential in all the cases examined 422 (dimensionless), and the average ammonia columns from IASI and GEOS-Chem (molecules cm<sup>-2</sup>). The four cases show a 423 similar pattern with the North European Plain exhibiting the highest emission potential. This has been shown in Figure 1, Figure 424 2, and Figure 5, as well as in Table 1, where  $\Gamma_{soil}$  is higher in regions with high ammonia columns. This is expected in fertilized 425 lands (croplands), since  $\Gamma_{soil}$  is proportional to the concertation of ammonia near the surface. The latter increases when the soil 426 content of ammonium (NH4<sup>+</sup>) increases following the application of nitrogen-based fertilizers.



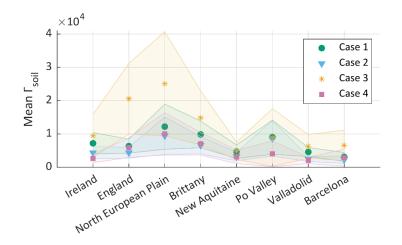


Figure 6. Mean ammonia emission potential  $\Gamma_{soil}$  per region and per case, with the error margin on the mean as the shaded area (95<sup>th</sup> percentile) for cases 1 to 4. The cases are explained in the discussion of Figure 5.

Figure 6 also shows that for cases 1 and 2 (GEOS-Chem) the emission potential in the Po Valley is almost equal to case 3 (IASI), with  $\Gamma_{soil} = 0.9$  and  $0.86 \times 10^4$  in cases 1 and 2, and  $0.89 \times 10^4$  in case 3 (see Table 1). To calculate  $\Gamma_{soil}$  from IASI NH<sub>3</sub> (case 3 and 4), we used T skin from ERA5 that coincides with the overpass of IASI. We used the same T skin values from ERA5 for case 2, as well as hourly concentrations of ammonia from GEOS-Chem (8:30 to 11:30 UTC). The ERA5 T skin are shown in Table 1. The effect of skin temperature through Eq. (2-1) makes the emission potential highly dependent on it. In fact,  $\Gamma_{soil}$  is both directly and inversely proportional to T skin, however, the exponential in the denominator has ~10 times more effect on the value of  $\Gamma_{soil}$  than the T skin in the numerator. Therefore, through Eq. (2-1), we conclude that an increase in temperature by 1°C will reduce  $\Gamma_{soil}$  by around -8 %.

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The standard deviation (shaded area) is found to be the highest in the North European Plain, which is also the largest region (hence higher variability is expected), especially when considering case 3 with IASI. IASI distinguishes different source sub-

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## 441 Table 1. Summary of ammonia average lifetime, emission potential, concentrations and the T skin in selected regions in Europe.

regions, leading to higher spatial variability of ammonia, and therefore  $\Gamma_{soil}$ .

| Region                     | Country                 | τ <sub>NH3</sub><br>[hours] | T skin [°C]      |                              | $\Gamma_{soil} 	imes 10^4$ [dimensionless] |        |        |        | NH <sub>3</sub> concentrations<br>[molecules × 10 <sup>15</sup> cm <sup>-2</sup> ] |               |                 |
|----------------------------|-------------------------|-----------------------------|------------------|------------------------------|--|--------|--------|--------|--|---------------|-----------------|
|                            |                         |                             | ERA5<br>9:30 UTC | MERRA-2 8:00 to<br>10:00 UTC | Case 1                                     | Case 2 | Case 3 | Case 4 | IASI   | GEOS-<br>Chem | Mean MRD<br>[%] |
| Ireland                    | Ireland                 | 3.34                        | 8.74             | 6.23                         | 0.72                                       | 0.44   | 0.94   | 0.26   | 2.5  | 1.4           | - 45            |
| England                    | England                 | 3.15                        | 8.54             | 5.73                         | 0.63                                       | 0.44   | 2.06   | 0.58   | 4.7  | 1             | - 79.2          |
| North<br>European<br>Plain | Belgium,<br>Netherlands | 5.16                        | 7.46             | 4.57                         | 1.22                                       | 0.95   | 2.51   | 1.00   | 7.6  | 3.5           | - 55            |
| Brittany                   | France                  | 6.93                        | 10.48            | 8.16                         | 0.98                                       | 0.66   | 1.48   | 0.70   | 5.8  | 3.2           | - 43.2          |
| New<br>Aquitaine           | France                  | 8.05                        | 11.25            | 7.47                         | 0.46                                       | 0.32   | 0.49   | 0.30   | 4.0  | 2.6           | - 34.1          |
| Po Valley                  | Italy                   | 7.10                        | 8.95             | 5.46                         | 0.90                                       | 0.86   | 0.89   | 0.40   | 4.0  | 3.8           | + 0.1           |
| Valladolid                 | Spain                   | 4.53                        | 11.64            | 6.93                         | 0.46                                       | 0.25   | 0.62   | 0.20   | 2.5  | 1.1           | - 57            |
| Barcelona                  | Spain                   | 4.94                        | 12.61            | 9.44                         | 0.31                                       | 0.25   | 0.65   | 0.28   | 3.2  | 1.4           | - 57.5          |

## 443 **3.3.** The effect of temperature change on the volatilization of ammonia

As seen in Eq. (2-1), higher skin temperatures favour volatilization of ammonia from the soil. In an attempt to understand how our simplified emission potential model behaves under changing climate, as well as under future scenarios, we adopt the future T skin simulations from EC-Earth climate model, into Eq. (2-1). The two climate socioeconomic scenarios that we consider are SSP2-4.5 ("middle of the road" scenario where trends broadly follow their historical patterns), and SSP5-8.5 (a world of rapid and unconstrained growth in economic output and energy use) (Riahi et al., 2017). The same Figure constructed using  $\Gamma_{soil}$  from GEOS-Chem (case 1) is shown in the supplementary material as Figure S5.

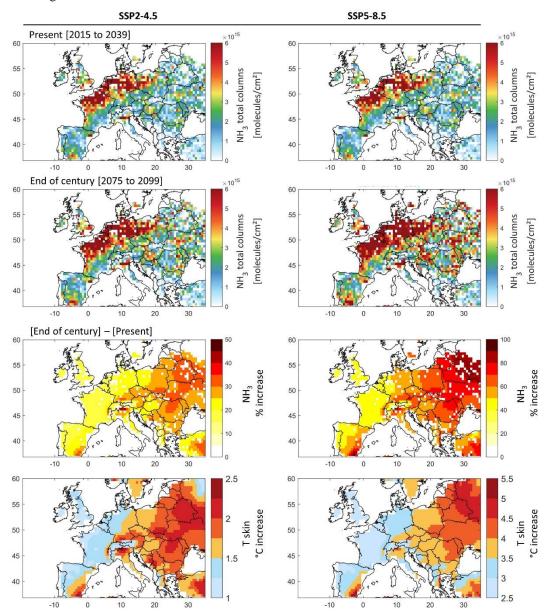


Figure 7. First and second rows: Ammonia total column concentrations during March (monthly averages) under the present climate [2015 to 2039] (first row), and in the end of century climate [2075 to 2099] (second row), under the socio-economic scenarios SSP2-4.5 (left) and SSP5-8.5 (right). Third and fourth rows: The percentage increase in ammonia concentration (third row), and the change in T skin in °C (fourth row) by the end of the century [2075 to 2099] with respect to present climate [2015 to 2039] under SSP2-4.5 (left) and SSP5-8.5 (right). Ammonia columns were calculated using ammonia emission potential  $\Gamma_{soil}$  derived from IASI and ERA5 for March 2011 (case 3), and EC-Earth T skin simulations for SSP2-4.5 and SSP5-8.5 extending from 2015 till 2099.

451 We calculate current and future ammonia columns assuming that the emission potential  $\Gamma_{soil}$  remains unchanged. In 452 other words, we assume that the same amount of fertilizers and manure is used until 2100 in the agricultural fields and

453 farms (unchanged ammonium soil content).

Figure 7 shows ammonia columns during the 25-year [2015 - 2039] representing the present climate (upper panels), and the end of the century [2075 - 2099] (middle panels). The ammonia columns in the 25-year average climate of the end of century with respect to present day climate (lower panels) are also shown.

458 Spatially, the present climate ammonia columns calculated from the T skin of the climate model and our emission 459 potential from IASI (case 3 in Figure 5), agree very well with those shown in Figure 1. We do not aim at validating or 460 directly comparing the two, as we are only interested in the climate response on ammonia concentration, i.e. by the 461 difference due to skin temperature increase (lower panels).

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463 From Figure 7 (lower panels) it can be seen that the increase in ammonia columns by the end of the century is more 464 severe in Eastern Europe. Under the most likely scenario (SSP2-4.5), ammonia columns vary between +15 % in France, to around +20 % in the North European Plain (Figure 7). The largest increase is detected in Eastern Europe, where 465 ammonia columns show an increase of up to +50 % (Figure 7, lower left panels), creating new potential 466 hotspots/sources of ammonia in Belarus, Ukraine, Hungary, Moldova, parts of Romania and Switzerland. Under the 467 468 SSP5-8.5 scenario, the results show an increase in ammonia columns of up to +100 % in Eastern Europe (Figure 7, 469 right lower panel). This is directly related to the higher projected increase in skin temperature over these regions. Other 470 studies have equally reported Eastern Europe to be more affected by climate change under future scenarios, as 471 compared to western Europe (European Environment Agency, 2022; Jacob et al., 2018). Spatially, the increase in 472 ammonia coincides with the increase in T skin.

Figure 8 depicts the change in ammonia columns under the SSP2-4.5 and SSP5-8.5 scenarios, for our source regions
(shown as rectangles in Figure 2). Ammonia columns increase is foreseen to be the highest in the Po Valley (Italy)
with +26 % and +59 % under SSP2-4.5 and SSP5-8.5 respectively. It is then followed by the agricultural areas around
Barcelona (Spain), and the North European Plain (Belgium, Netherlands) with an increase of +21 % (+49 %) and +20
(+53 %) respectively, under the SSP2-4.5 (SSP5-8.5) scenario. Under the SSP5-8.5, the increase in ammonia

columns in percentage is more than twice the change under SSP2-4.5 (+127 % in the case of the Po Valley for instance).
 The Po Valley is adjacent to the Alps mountains, and due to global warming, this region is expected to experience

479 The Fo Valley is adjacent to the Alps mountains, and due to global warming, this region is expected to experience 480 increased evapotranspiration (Donnelly et al., 2017), which is a major factor that leads to the volatilization of ammonia.

481 The local and regional effect of volatilization of ammonia under different climate scenarios remains difficult to be

482 properly assessed. Even under the "middle of the road" scenario 2-4.5, and without climate extremes (e.g. heatwaves),

483 Europe might be facing big challenges in air quality for regions nearby or downwind agricultural regions, since

484 chemistry and atmospheric transport (Figure 3) drive the loss of ammonia during the growing season in this part of the 485 world.

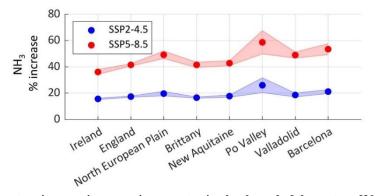


Figure 8. The percentage increase in ammonia concentration by the end of the century [2075 to 2099] with respect to the present climate [2015 to 2039] under the two climate scenarios SSP2-4.5 (blue) and SSP5-8.5 (red), in the source regions investigated in this study. The shades around each line represent the standard deviation from the mean.

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487 An increase in ammonia concentration poses a significant and yet poorly understood effect on local and regional air 488 quality through the increase in  $PM_{2.5}$  concentration. We note, however, that ammonia columns in the soil are governed 489 by a threshold. Higher temperatures will increase the rate of volatilization of ammonia from the soil, but only up to a 490 certain point where no dissolved ammonium is left. Plants, however, can also be a source of ammonia when exposed

491 to stressful conditions. For example, under heat stress and in instances where there is no ammonia in the air, increase

492 in air temperature results in exponential increase in ammonia emission from plants' leaves (Husted and Schjoerring,

493 1996).

# 494 **4.** Conclusions

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Agriculture worldwide has fed the human race for thousands of years, and will continue to do so, as mankind highly 496 497 relies on it. Emissions from agricultural activities will inevitably increase, in order to meet the expected yield. In this 498 study, we use a variety of state-of-the-art datasets (satellite, reanalysis and model simulation) to calculate the first 499 regional map of ammonia emission potential during the start of the growing season in Europe. The emission potential 500 can be used as a proxy to calculate ammonia columns in the atmosphere, and as such to assess its deposition, 501 atmospheric transport, and contribution to PM formation. First, we show that the GEOS-Chem chemistry transport 502 model is able to reproduce key spatio-temporal patterns of ammonia levels over Europe. The ammonia budget is 503 governed by the emissions over source regions (North European Plain, Brittany and the Po valley), as well as by key 504 loss processes. We find that chemical loss pathway is responsible of 50 % or more of the total ammonia loss over 505 Europe. From the GEOS-Chem simulation, we calculate the average ammonia lifetime in the atmosphere which ranges 506 between 4 and 12 hours in agricultural source regions of Europe. From this, and using the mass transfer coefficient for different land cover types, we calculate a range of emission potentials  $\Gamma_{soil}$  from IASI and GEOS-Chem. We find that 507  $\Gamma_{soil}$  ranges between from  $0.2 \times 10^4$  to  $2.5 \times 10^4$  in fertilized lands (croplands). Choosing a variable k from the 508 literature, and based on different land cover types from MODIS, we calculate  $\Gamma_{soil}$  values that are consistent with those 509 510 found in the literature. The increase in T skin is expected to have an effect on the emission of ammonia from the soil. 511 Using T skin from the EC-Earth climate model, we estimate ammonia columns by the end of the century [2075 – 512 2099], and compare it to columns of the present climate [2015 - 2039]. Our results show that ammonia columns might 513 double under the SSP5-8.5 scenario, and might increase by up to 50 % under the most likely SSP2-4.5 scenario. The 514 eastern part of Europe is the most affected by the change in temperatures, and it is where we find the highest ammonia 515 columns increase. Among the regions of focus, Italy, Spain, Belgium and the Netherlands are the most affected, as 516 compared to France, England and Ireland. The highest increase in ammonia columns is observed in the Po Valley in Italy (+59 % under the SSP5-8.5). 517

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519 We calculate ammonia concentration under future climate and during the start of the growing season (March) in 520 Europe. However, in order to grasp the yearly budget of ammonia, it is crucial to apply this method to all seasons of 521 the year; especially in regions with extensive agricultural activities, such as the United States, India, and China. In 522 addition to this, more field measurements of ammonia emission potential ( $\Gamma_{soil}$ ) in different land use/cover types are 523 required, this can help us perform better comparison with emission potentials calculated from model and satellite data. 524 Finally, having ammonia columns at different times of the day, from field observations or satellite measurements will 525 allow quantification of daily emission potentials, that will in turn help us understand its diurnal variability. This will 526 be ensured with the launch of the Infrared Sounder (IRS) on the Meteosat Third Generation (MTG) geostationary 527 satellites scheduled in 2025.

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# 542 A. Appendix A

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# 1. Ammonia-Ammonium equilibrium

544 Ammonia (NH<sub>3</sub>) is a water-soluble gas, it undergoes protonation with  $H^+$  from the hydronium ion  $H_3O^+$  in an aqueous 545 solution in order to give ammonium (NH<sub>4</sub><sup>+</sup> cation), the dissociation equation is expressed as follows:

$$NH_{3(aq)} + H_3O^+ \stackrel{K_{NH4+}}{\longleftrightarrow} NH_{4(aq)}^+ + HO^-$$
(A-1)

546 547 Or

$$NH_{3(aq)} + H^{+} \stackrel{K_{NH4+}}{\longleftrightarrow} NH_{4(aq)}^{+}$$
(A-2)

548

549 With  $K_{NH4+}$  as the ammonium-ammonia dissociation equilibrium constant that can be expressed as:

$$K_{NH_{4}^{+}} = \frac{[NH_{3}(aq)][H^{+}]}{[NH_{4}^{+}(aq)]}$$
(A-3)

550 551

552 The solubility of ammonia in water is affected by the temperature and the acidity (pH) of the solvent (water). The 553 equilibrium constant can be expressed as follows:

$$K_{NH_4+} = 5.67.10^{-10} \exp\left[-6286\left(\frac{1}{T} - \frac{1}{298.15}\right)\right]$$
(A-4)

554

## 555 **2.** Henry's equilibrium

556 Upon its dissolution in water, NH<sub>3</sub> obeys the Henry's law. Ammonia gas  $(NH_{3(g)})$  near the surface of the solvent is 557 in equilibrium with the dissolved ammonia in the aqueous phase  $NH_{3(aq)}$  (in water). Henry's equilibrium is expressed 558 as follows:

$$NH_{3(g)} \stackrel{H_{NH_3}}{\longleftrightarrow} NH_{3(aq)}$$
 (A-5)

559 560

where H<sub>NH3</sub> is Henry's constant, which can be expressed as follows (Wichink Kruit, 2010):

$$H_{NH3} = \frac{[NH_3(aq)]}{[NH_3(g)]} = 5.527 \cdot 10^{-4} \cdot \exp\left[4092\left(\frac{1}{T} - \frac{1}{298.15}\right)\right]$$
(A-6)

561

562 The partial pressure of ammonia near the surface of the soil can be calculated using Henry's constant and the 563 dissociation equilibrium (Wichink Kruit, 2010):

$$P_{NH3} = \frac{K_{NH_4^+}[NH_4^+]}{H_{NH_3}[H^+]} = \frac{5.67.10^{-10} \cdot \exp\left[-6286\left(\frac{1}{T} - \frac{1}{298.15}\right)\right]}{5.527.10^{-4} \cdot \exp\left[4092\left(\frac{1}{T} - \frac{1}{298.15}\right)\right]} \times \frac{[NH_4^+]}{[H^+]}$$
(A-7)

564

If we use the ideal gas law (PV=nRT), we can draw the link between the mass density of ammonia  $(NH_{3(g)})$  and the partial pressure:

$$\chi_{NH_3} = \frac{P_{NH_3} \cdot M_{NH_3}}{R T}$$
(A-8)

567

568 Where  $\chi_{NH_3}$  is the concentration of NH<sub>3</sub> at the soil surface (kg m<sup>-3</sup>),  $P_{NH_3}$  is the partial pressure of NH<sub>3</sub> near the surface 569 (atm), M<sub>NH3</sub> is the molar mass of NH<sub>3</sub> (kg mol<sup>-1</sup>), R is the gas constant (0.082 atm L mol<sup>-1</sup> K<sup>-1</sup>), and T is the temperature 570 in Kelvin.

571 Substituting Eq. (A-7) into (A-8) we get:

$$\chi_{NH_3} = \frac{2.75 \cdot 10^9 \left(\frac{gK}{m^3}\right)}{T_{soil}} \exp\left[\frac{-1.04 \cdot 10^4}{T_{soil}}\right] \Gamma_{soil}$$
(A-9)

Where  $\chi_{NH_2}$  is the concentration of ammonia at the soil surface at equilibrium (g m<sup>-3</sup>), and is referred to as the 573 574 compensation point,  $T_{soil}$  is the temperature of the soil (Kelvin),  $\Gamma_{NH_3}$  is the NH<sub>3</sub> emission potential from the soil and is a dimensionless ratio between  $[NH_4^+]$  and  $[H^+]$ . 575

#### 576 3. Ammonia total columns from IASI

577 In this study we use the total columns of ammonia from IASI (molecules m<sup>-2</sup>) since in order to calculate the emission potential  $\Gamma_{soil}$ , we should draw the link between these columns and this parameter. The bi-directional exchange of NH<sub>3</sub> 578 579 between the surface and the atmosphere can be expressed by the flux (assuming a flux independent of time) (Roelle 580 and Aneja, 2005; Zhang et al., 2010):

$$Flux_{NH_3} = k \left( [NH_3]^{soil} - [NH_3]^{atm} \right)$$
(A-10)

581

where  $Flux_{NH_3}$  is the bidirectional flux between the soil and the atmosphere (molecules (m<sup>2</sup> s)<sup>-1</sup>), k is the soil – 582 atmosphere exchange velocity (m s<sup>-1</sup>), also known as the mass transfer coefficient;  $[NH_3]^{soil}$  is the concentration of 583  $NH_{3(g)}$  in the soil, and  $[NH_3]^{atm}$  is the concentration of  $NH_{3(g)}$  in the atmosphere near the surface (molecules m<sup>-3</sup>). We 584 can consider that  $[NH_3]^{atm}$  is identical to the total column of NH<sub>3</sub> provided by IASI and denoted here as  $[NH_3]^{col}$ . 585 This is because most of the atmospheric NH<sub>3</sub> are located in the lower boundary layer (Dammers et al., 2019). Assuming 586

587 a first order dissociation of NH<sub>3</sub>, we can express the change in the  $[NH_3]^{col}$  total columns as follows:

$$\frac{d [NH_3]^{col}}{dt} = Flux_{NH_3} - k'[NH_3]^{col}$$
(A-11)

589

Where k' is the rate of dissociation of first order  $k' = 1/\tau$  (m s<sup>-1</sup>), with  $\tau$  the lifetime of NH<sub>3</sub> in the atmosphere. Assuming steady state, and considering the  $[NH_3]^{atm}$  as the  $[NH_3]^{col}$ , and  $[NH_3]^{soil}$  as  $\chi_{NH_3}$ , Eq. (A-11) can be 590 as:

$$k\left(\frac{N_{a}\cdot X_{NH_3}}{M_{NH_3}} - \frac{1}{c}\left[NH_3\right]^{col}\right) = \frac{[NH_3]^{col}}{\tau}$$
(A-12)

592

Where c is the column height and is equal to 6 km. It is important to note that we neglect the effect of transport by 593

wind since we only look at large regions. Finally, the total column of ammonia  $[NH_3]^{col}$  can be written as:  $[NH_3]^{col} = \frac{N_a \cdot \chi_{NH_3}}{M_{NH_3} \cdot (c + \frac{1}{k\tau})}$ 594 (A-13)

595

The column height is not considered anymore because it is negligible compared to  $\frac{1}{k\tau}$ , using Eq. (A-9) into (A-13) 596 597 we get:

$$[NH_3]^{col} = \frac{9.72 \cdot 10^{23}}{T_{soil}} \exp\left[\frac{-1.04 \cdot 10^4}{T_{soil}}\right] \Gamma_{NH_3} \cdot k\tau \qquad \left(\frac{molecules}{cm^2}\right)$$
(A-14)

598

Note that  $9.72.10^{23} = \frac{a \cdot N_a \cdot c'}{M_{NH_3}} \left(\frac{K \text{ molecules}}{s \text{ cm}^2}\right)$ , where  $a = 2.75.10^3 (g \text{ K cm}^{-3})$ ,  $N_a$  Avogadro's number 599  $(6.0221409 \times 10^{23} \text{ molecules mol}^{-1}), c' = 10^{-2} \text{ is added to convert } k \text{ from m s}^{-1} \text{ to cm s}^{-1}, \text{ and } M_{NH_3} \text{ the molar mass of } M_{NH_3} \text{ the molar mas$ 600 NH<sub>2</sub> (17.031 g mol<sup>-1</sup>). The emission potential of NH<sub>3</sub> from the soil can be written as: 601

$$\Gamma_{soil} = \frac{[NH_3]^{col} \cdot T_{soil}}{\exp(\frac{-b}{T_{soil}})} \frac{M_{NH_3}}{a \cdot N_a \cdot 10^{-2}} \cdot \frac{1}{k\tau}$$
(A-15)

602

where  $b = 1.04 \times 10^4 K$ . 603

#### Author contribution

RA contributed to the conception and design of the article, developed the code, wrote the manuscript, analysed and interpreted of the data, and approved the version for submission; CV, CC, and PFC revised the manuscript; WCP provided the GEOS-Chem simulation data, and revised the manuscript; NE provided ammonia lifetime calculation using the LMDz-OR-INCA chemistry transport model and commented on the manuscript; MVD and LC contributed to the acquisition of the IASI ammonia data (NH3-v3R-ERA5), and revised the manuscript; SS contributed to the conception and design of the article, provided the EC-Earth temperature data, revised the manuscript, and approved the version for submission.

# Acknowledgments

615 The IASI mission is a joint mission of EUMETSAT and the Centre National d'Etudes Spatiales (CNES, France). The authors acknowledge the Aeris data infrastructure for providing the IASI L1C and L2 data.

#### **Funding information**

Rimal Abeed is grateful to CNES for financial support. The research in Belgium was funded by the Belgian State Federal Office for Scientific, Technical and Cultural Affairs (Prodex HIRS) and the Air Liquide Foundation (TAPIR project). This work is also partly supported by the FED-tWIN project ARENBERG ("Assessing the Reactive Nitrogen Budget and Emissions at Regional and Global Scales") funded via the Belgian Science Policy Office (BELSPO). L. Clarisse is Research Associate supported by the Belgian F.R.S.-FNRS. C. Clerbaux is grateful to CNES for scientific collaboration and financial support. N. Evangeliou was funded by Norges Forskningsråd (ROM- FORSK – Program for romforskning of the Research Council of Norway (grant no. 275407)).

#### **Competing interests**

625 The authors are aware of no competing interests.

#### Data accessibility statement

The IASI-NH<sub>3</sub> used in this study are retrieved from the Aeris data infrastructure (<u>https://iasi.aeris-data.fr/nh3r-era5/</u>). ERA5 skin temperature from 1979 to present are available for download in the following DOI: <u>10.24381/cds.adbb2d47</u>. The GEOS-Chem outputs used in this study are only available upon request. EC-Earth3 model output prepared for CMIP6 ScenarioMIP are retrieved here: <u>https://doi.org/10.22033/ESGF/CMIP6.727</u>. The MODIS land cover data are available for download in the following link: <u>https://doi.org/10.5067/MODIS/MCD12Q1.006</u>.

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